

Slides for CIS 675

NP-Complete Problems, Part 2

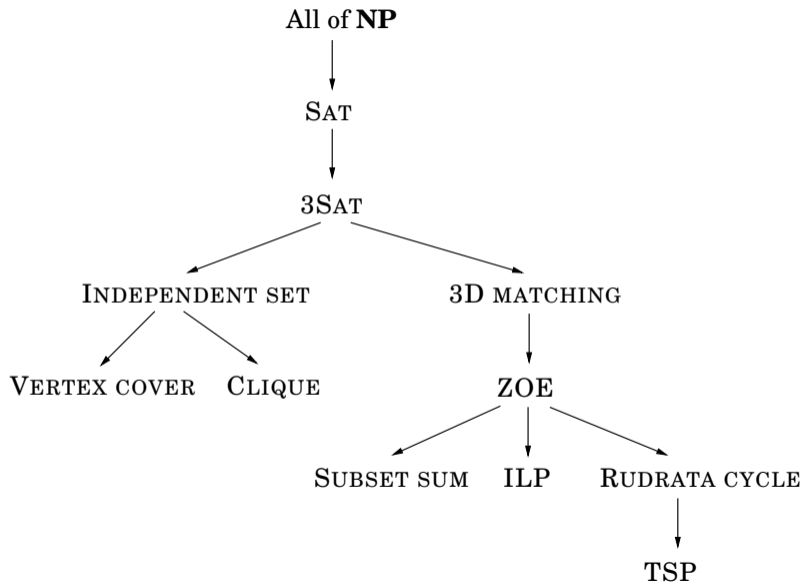
Jim Royer

DPV Chapter 8

April 15, 2019

Uncredited diagrams are from DPV or homemade.

The Plan of §8.3



Warm up: Rudrata (s, t) -Path \leq Rudrata Cycle

Rudrata (s, t) -Path

Given: $G = (V, E)$ and $s, t \in V$.

Find: A path from s to t in G passing through each vertex once.

Rudrata Cycle

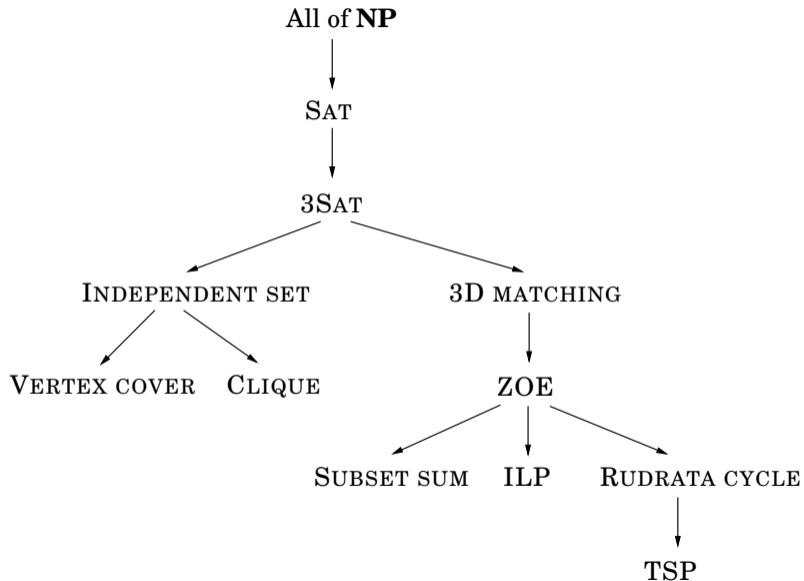
Given: $G = (V, E)$.

Find: A cycle in G passing through each vertex once.

Rudrata (s, t) -Path \leq Rudrata Cycle:

- Given an instance of Rudrata (s, t) -Path, (G, s, t) , construct G' by adding a new vertex x and new edges (x, s) and (x, t) .
 - If P is a Rudrata-cycle in G' , then leaving x , (x, s) and (x, t) out of P gives an (s, t) -Rudrata path in G .
 - If G has a (s, t) -Rudrata path P , then adding (x, s) and (x, t) to P yields a Rudrata cycle in G' .
- \therefore If G' has no Rudrata cycle, then G has no (s, t) -Rudrata path.

The Plan of §8.3



3SAT \leq Independent Set, 1

3SAT

Given: A CNF formula θ in which each clause has at most 3 literals.

Find: A satisfying assignment for θ .

Independent Set Problem

Given: $G = (V, E)$ and b .

Find: An independent set for G of size $\geq b$.

I.e., Find $U \subseteq V$ with $|U| \geq b$ and $(\forall u, v \in U)[(u, v) \notin E]$.

Puzzle:

These are very different looking problems.
How to we get a reduction?

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Puzzle:

These are very different looking problems.
How to we get a reduction?

Think circuits, but not too literally.

3SAT \leq Independent Set, 2

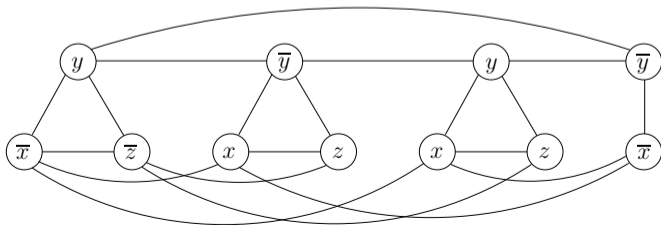
- To build a satisfying assignment of an instance of 3SAT, we have to pick out at least one literal per clause to be TRUE — consistently!

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Consider: $(\bar{x} \vee y \vee \bar{z}) \wedge (x \vee \bar{y} \vee z) \wedge (x \vee y \vee z) \wedge (\bar{x} \vee \bar{y})$.

- A clause $(l_1 \vee l_2 \vee l_3)$ is represented by a triangle with verts labeled: $l_1, l_2,$ & l_3 .

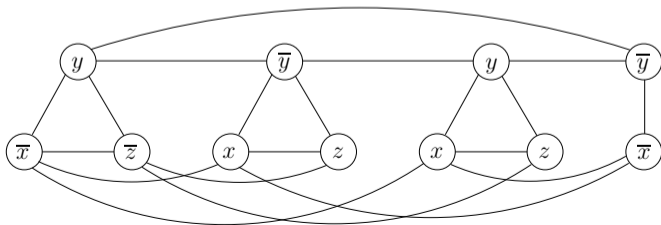


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- *Idea:* If $v \in U$ an indep. set and v has label l , then the truth assignment corresponding to U sets l to TRUE.

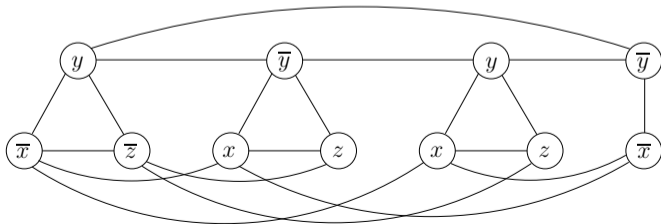


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- Set $g = \#$ of clauses. So any indep. set must have one vertex from each triangle. (Why?)



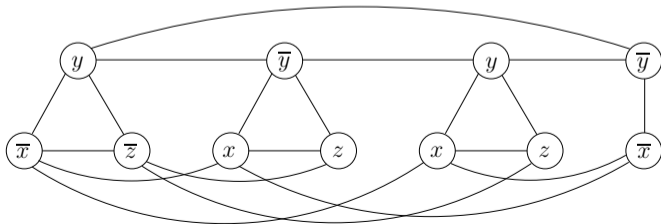
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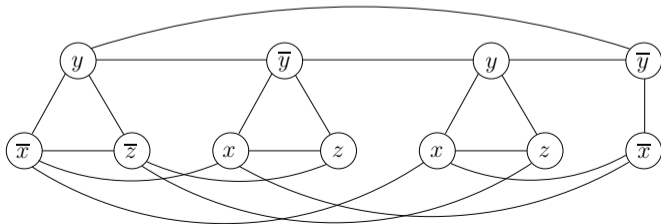


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- But we have to have consistency checks. We don't want to set x and \bar{x} to TRUE.
- So put an edge between each occurrence of a variable x and each occurrence of \bar{x} . This enforces consistency. (Why?)



3SAT \leq Independent Set, 3

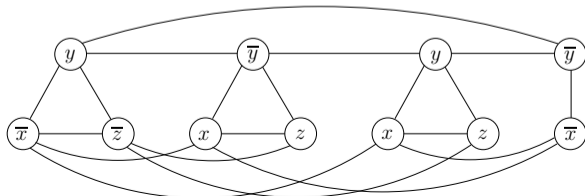
Construction: 3SAT instance \mapsto IS instance

- Given an instance of 3SAT C_1, \dots, C_k .
- For each clause $C_i = (\ell_1, \ell_2, \ell_3)$, build a triangle with vertices labeled $\ell_1, \ell_2,$ & ℓ_3 .
- Add an edge between each literal and all of its opposites.
- Set $g = k$.

Construction: IS solution \mapsto 3SAT solution

- Given an independent set U : for each $v \in U$ with label ℓ , set ℓ to TRUE.
- For each variable that does not yet have a truth value, set it to TRUE.

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Construction: IS solution \mapsto 3SAT solution

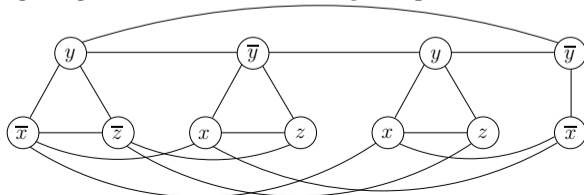
- Given an independent set U : for each $v \in U$ with label ℓ , set ℓ to TRUE.
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Claim 1: Both constructions are poly-time.

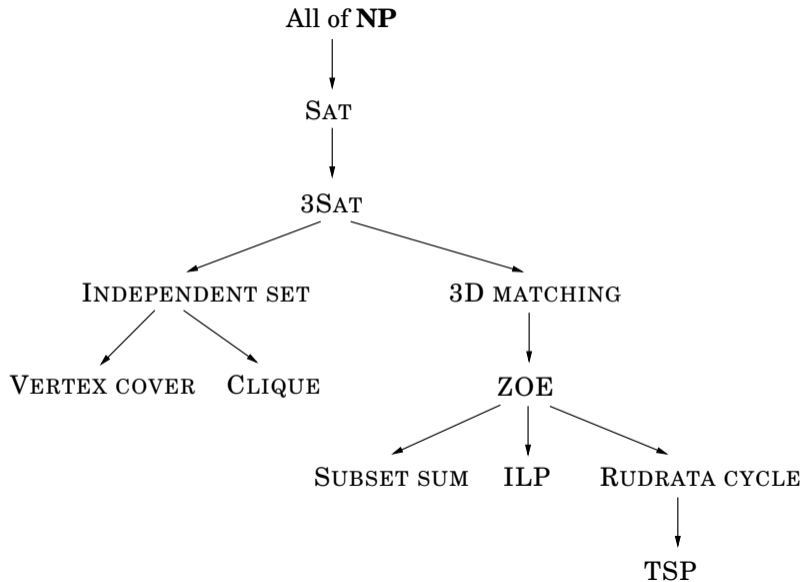
Claim 2: Given an indep. set, we can construct a satisfying assignment for C_1, \dots, C_k .

Claim 3': If C_1, \dots, C_k has a satisfying assignment, then there is size g indep. set.

$$\begin{aligned} &(\bar{x} \vee y \vee \bar{z}) \wedge \\ &(x \vee \bar{y} \vee z) \wedge \\ &(x \vee y \vee z) \wedge \\ &(\bar{x} \vee \bar{y}) \end{aligned}$$



The Plan of §8.3



SAT \leq 3SAT

Construction: SAT instance \mapsto 3SAT instance

- Translate each clause to sequence of clauses.
- $(\ell_1 \vee \ell_2 \vee \dots \vee \ell_k) \mapsto (\ell_1 \vee \ell_2 \vee \mathbf{y_1}) (\overline{\mathbf{y_1}} \vee \ell_3 \vee \mathbf{y_2}) \dots (\overline{\mathbf{y_{k-3}}} \vee \ell_{k-1} \vee \ell_k)$
where $k > 3$ and $\mathbf{y_1}, \dots, \mathbf{y_{k-3}}$ are new vars.
- Clauses with ≤ 3 literals translate to themselves.

Construction: 3SAT solution \mapsto SAT solution

- Take the truth assignment for the 3SAT formula & restrict it to the original vars.

SAT \leq 3SAT

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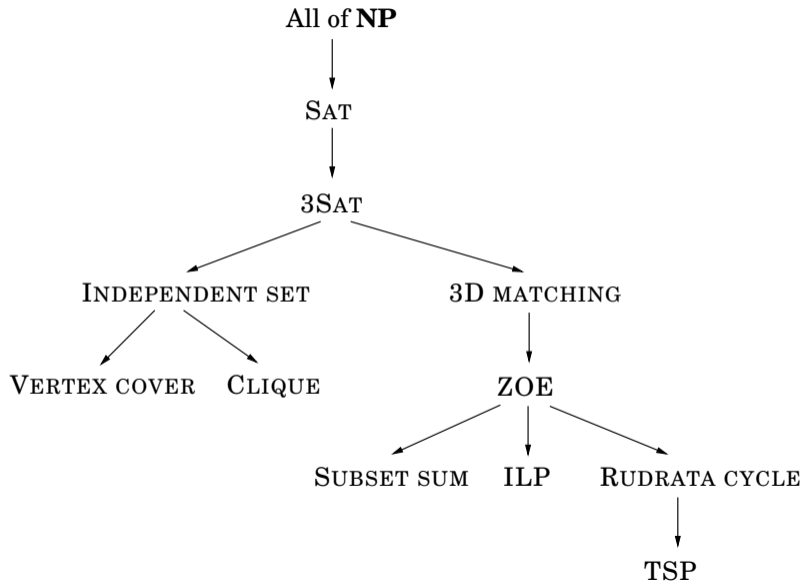
- Take the truth assignment for the 3SAT formula & restrict it to the original vars.

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Claim 3': If the SAT formula is satisfiable, so is the 3SAT formula.

The Plan of §8.3

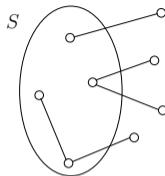


Independent-Set \leq Vertex Cover

Definition

Suppose $G = (V, E)$ is an undirected graph and $S \subseteq V$.

- (a) S is *independent* when for each $u, v \in S$, $(u, v) \notin E$.
- (b) S is a *vertex cover* when each edge of E has at least one endpoint in S .



Independent Set Problem

Given: G and b .

Find: An indep. set for G of size $\geq b$.

Vertex Cover Problem

Given: G and b .

Find: A vertex cover for G of size $\leq b$.

Reduction:

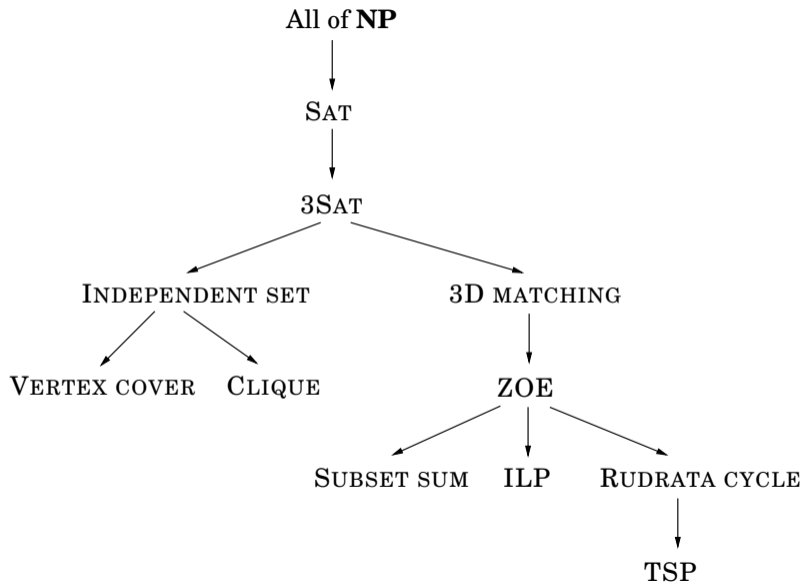
$$f((V, E), b) = ((V, E), |V| - b).$$

$$h(S) = V - S.$$

Claims

1. Both constructions are poly-time.
2. If U is a vertex cover for G with $|U| \leq |V| - b$, then $V - U$ is an indep. set with $|V - U| \geq b$.
3. If G has a indep. set of size $\geq b$, then G has a vertex cover of size $|V| - b$.

The Plan of §8.3



Independent-Set \trianglelefteq Clique

Definition

Suppose $G = (V, E)$ is an undirected graph and $S \subseteq V$.

- (a) S is *independent* when for each $u, v \in S$, $(u, v) \notin E$.
- (b) U is a *clique* when for each distinct $u, v \in U$, $(u, v) \in E$.
- (c) $\bar{G} = (V, \bar{E})$ where $\bar{E} = \{ (u, v) : (u, v) \notin E \}$.

Lemma

S is an independent set in $G \iff S$ is a clique in \bar{G} .

Independent Set Problem

Given: G and b .

Find: An indep. set for G of size $\geq b$.

Clique Problem

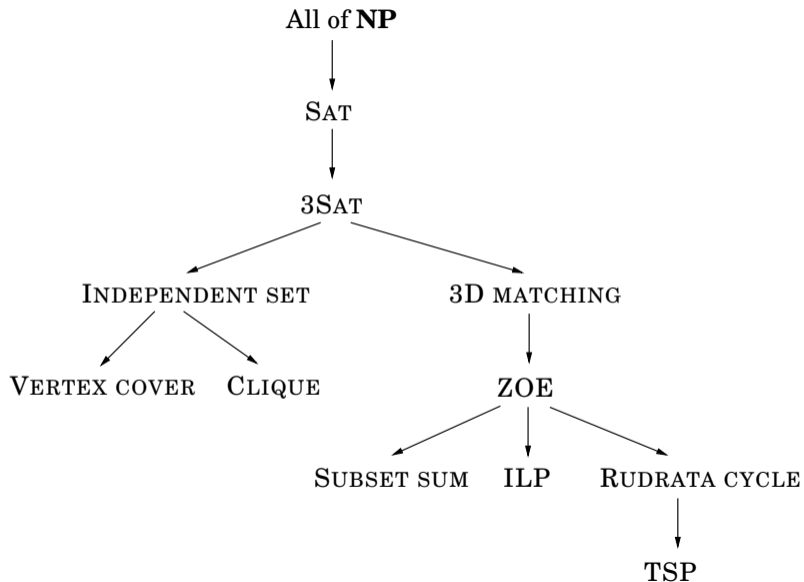
Given: G and b .

Find: A clique in G of size $\geq b$.

$$f((V, E), b) = ??$$

$$h(S) = ??$$

The Plan of §8.3



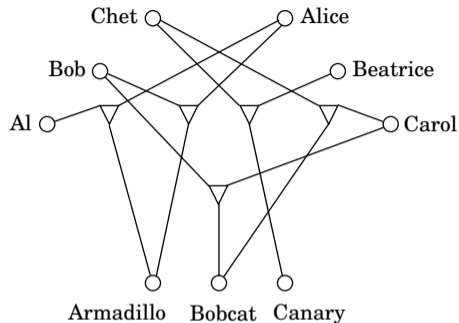
Recall: Three-dimensional matching

3D Matching

Given: $R \subseteq A \times B \times C$ where $|A| = |B| = |C| = n$.

Find: A subset $M \subseteq R$ of n many triples such that if (a, b, c) and (a', b', c') are distinct elements of M , then $a \neq a'$, $b \neq b'$, and $c \neq c'$.

- 2D matching is poly-time (via Ford-Fulkerson).
- The only known algorithms for 3D Matching are exponential time.



$$R = \{(Al, Alice, Armadillo), \\ (Bob, Alice, Armadillo), \\ (Bob, Carol, Bobcat), \\ (Chet, Beatrice, Canary), \\ (Chet, Carol, Bobcat)\}$$

3SAT \leq 3D Matching, 1

3D Matching

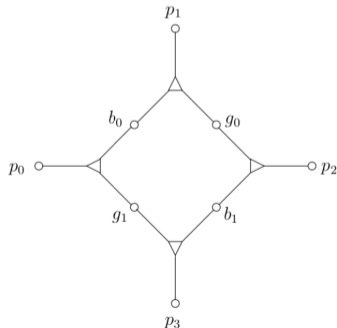
Given: $R \subseteq B \times G \times P$ with $|B| = |G| = |P| = n$.

Find: A size- n subset $M \subseteq R$ such that

if (b, g, p) and (b', g', p') are distinct elements of M ,
then $b \neq b', g \neq g',$ and $p \neq p'$.

Notes: $B =$ boys, $G =$ girls, $P =$ pets.

Exactly one of each Boy, Girl, Pet is chosen in the matching.



- Four triples:
 $(b_0, g_1, p_0), (b_1, g_0, p_2), (b_0, g_0, p_1), (b_1, g_1, p_3)$
- b_0, b_1, g_0, g_1 appear only in these triples.
- Any 3DM has to take either
 - ▶ $(b_0, g_1, p_0), (b_1, g_0, p_2)$ can represent True
 - ▶ $(b_0, g_0, p_1), (b_1, g_1, p_3)$ can represent False
- For each variable (from the 3SAT instance) x , create a copy of this gadget where $b_0^x, b_1^x \in B, g_0^x, g_1^x \in G,$ and $p_0^x, p_1^x \in P$

3SAT \leq 3D Matching, 2

Assumption: Preprocessing the 3SAT Instance

Without loss of generality, we assume no literal in the 3SAT instance has more than two occurrences. (See the bottom of Page 251 in the text—at the end of the SAT \leq 3SAT subsection.)

- For a clause $c = (x \vee \bar{y} \vee z)$ add $b_c \in B$ and $g_c \in G$ and add triples
 - ▶ (b_c, g_c, p_1^x) (or else (b_c, g_c, p_3^x)) (if x is true, then p_1^x and p_3^x are available)
 - ▶ (b_c, g_c, p_0^y) (or else (b_c, g_c, p_2^y)) (if y is false, then p_0^y and p_2^y are available)
 - ▶ (b_c, g_c, p_1^z) (or else (b_c, g_c, p_3^z)) (if z is true, then p_1^z and p_3^z are available)
- Similarly, for the other clauses.
- Make sure each literal in clause has a different p_i to match with b_c and g_c . (Here is where the above assumption comes in.)

Clean-up:

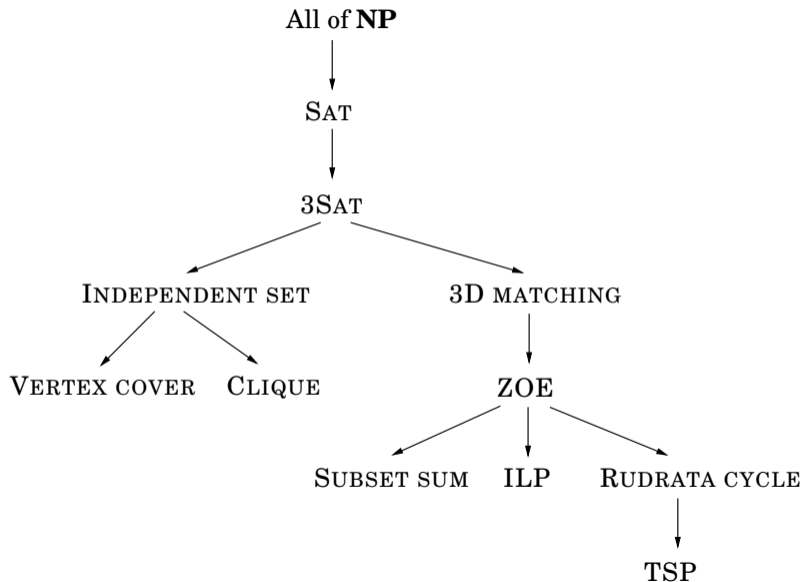
- Suppose the 3SAT instance has n variables and m clauses.
- For $j = 1, \dots, 2n - m$, add $b_j^* \in B$, $g_j^* \in G$ and the set of triples $\{(b_i^*, g_i^*, p_j^v) : v \in V, j = 0, \dots, 3\}$. I.e., b_i^* and g_i^* like any P .

3SAT \leq 3D Matching, 3

Claim

- The construction is poly-time.
- If the instance of 3SAT is satisfiable, then there is a 3D matching in the set of triples constructed.
- If there is a 3D matching in the set of triples constructed, then the instance of 3SAT is satisfiable.

The Plan of §8.3



3D Matching \leq ZOE, 1

3D Matching

Given: $R \subseteq U \times V \times W$ with $|U| = |V| = |W| = m$.

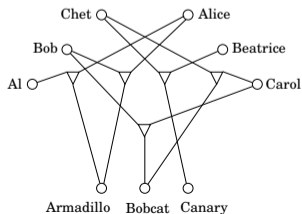
Find: A size- m subset $M \subseteq R$ such that
if (u, v, w) and (u', v', w') are distinct elements
of M , **then** $u \neq u'$, $v \neq v'$, and $w \neq w'$.

Construction

Zero-One Equations (ZOE)

Given: A , an $m \times n$ matrix of 0's and 1's

Find: \vec{x} , a n -vector of 0's and 1's such that $A\vec{x} = \vec{1}$.



$$A = \begin{pmatrix} 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 1 \\ 0 & 1 & 1 & 0 & 0 \\ 1 & 0 & 0 & 0 & 1 \\ 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 1 & 0 \\ 1 & 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 1 & 0 \\ 0 & 1 & 0 & 0 & 0 \end{pmatrix}$$

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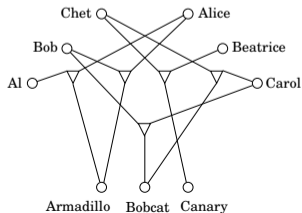
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- Suppose $n = |R|$.

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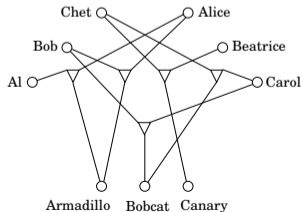
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- Suppose $n = |R|$.
- x_j variable for the j -th triple.

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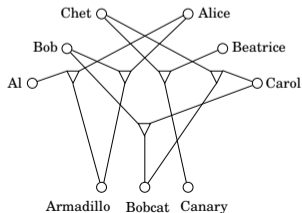
Construction

- Suppose $n = |R|$.
- x_j variable for the j -th triple.
- $x_j = 1 \iff j$ -th triple is used.

Zero-One Equations (ZOE)

Given: A , an $m \times n$ matrix of 0's and 1's

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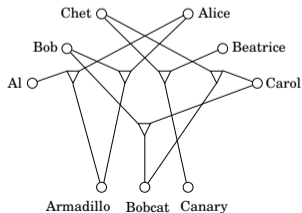
Given: $R \subseteq U \times V \times W$ with $|U| = |V| = |W| = m$.

Find: A size- m subset $M \subseteq R$ such that
if (u, v, w) and (u', v', w') are distinct elements
of M , then $u \neq u'$, $v \neq v'$, and $w \neq w'$.

Zero-One Equations (ZOE)

Given: A , an $m \times n$ matrix of 0's and 1's

Find: \vec{x} , a n -vector of 0's and 1's such that $A\vec{x} = \vec{1}$.



$$A = \begin{pmatrix} 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 1 \\ 0 & 1 & 1 & 0 & 0 \\ 1 & 0 & 0 & 0 & 1 \\ 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 1 & 0 \\ 1 & 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 1 & 0 \\ 0 & 1 & 0 & 0 & 0 \end{pmatrix}$$

Construction

- Suppose $n = |R|$.
- x_j variable for the j -th triple.
- $x_j = 1 \iff j$ -th triple is used.
- $(A_{i,j})$ is $3m \times n$

3D Matching \leq ZOE, 1

3D Matching

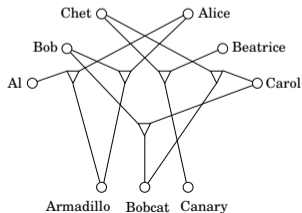
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3D Matching \leq ZOE, 1

3D Matching

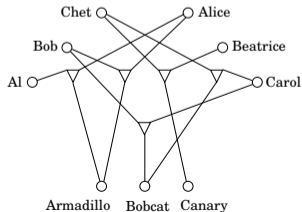
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Construction

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3D Matching \leq ZOE, 1

3D Matching

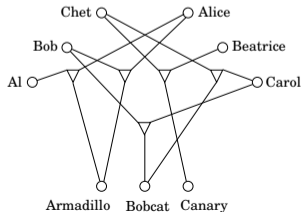
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Construction

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3D Matching \leq ZOE, 1

3D Matching

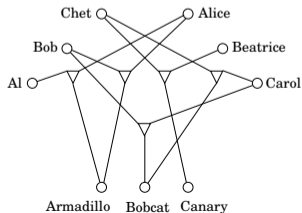
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- $A_{2m+i,j} = 1 \iff$ the i -th elm. of W is used in the j -th triple.
- So $A\vec{x} = \vec{1}$ means ...

3D Matching \leq ZOE, 2

3D Matching

Given: $R \subseteq U \times V \times W$ with $|U| = |V| = |W| = n$.

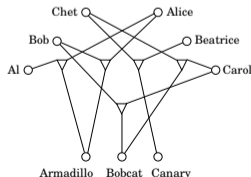
Find: A size- n subset $M \subseteq R$ such that

if (u, v, w) and (u', v', w') are distinct elements of M , *then* $u \neq u'$, $v \neq v'$, and $w \neq w'$.

Zero-One Equations (ZOE)

Given: A , an $m \times n$ matrix of 0's and 1's

Find: \vec{x} , a n -vector of 0's and 1's such that $A\vec{x} = \vec{1}$.



$$A = \begin{pmatrix} 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 1 \\ 0 & 1 & 1 & 0 & 0 \\ 1 & 0 & 0 & 0 & 1 \\ 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 1 & 0 \\ 1 & 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 1 & 0 \\ 0 & 1 & 0 & 0 & 0 \end{pmatrix}$$

Construction: Example

$R = \{ t_1, \dots, t_5 \}$ where

$t_1 = (\text{Al}, \text{Alice}, \text{Armadillo})$

$t_2 = (\text{Chet}, \text{Beatrice}, \text{Canary})$

$t_3 = (\text{Chet}, \text{Carol}, \text{Bobcat})$

$t_4 = (\text{Bob}, \text{Carol}, \text{Bobcat})$

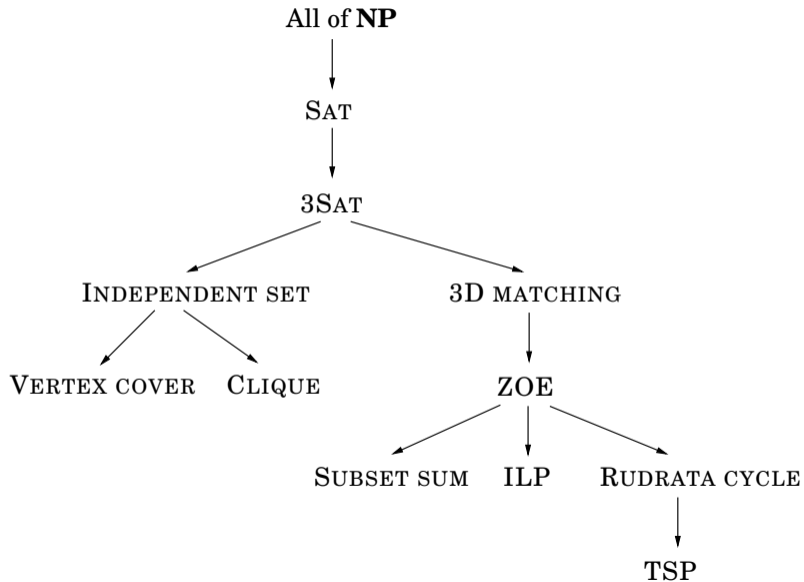
$t_5 = (\text{Bob}, \text{Alice}, \text{Armadillo})$

	t_1	t_2	t_3	t_4	t_5
Al	1	0	0	0	0
Bob	0	0	0	1	1
Chet	0	1	1	0	0
Alice	1	0	0	0	1
Beatrice	0	1	0	0	0
Carol	0	0	1	1	0
Armadillo	1	0	0	0	1
Bobcat	0	0	1	1	0
Canary	0	1	0	0	0

$$A \times (1, 1, 1, 0, 0) = (1, 0, 2, 1, 1, 1, 1, 1, 1)$$

$$A \times (1, 1, 0, 1, 0) = (1, 1, 1, 1, 1, 1, 1, 1, 1)$$

The Plan of §8.3



ZOE \leq Subset Sum

Zero-One Equations (ZOE)

Given: A , an $m \times n$ matrix of 0's and 1's

Find: \vec{x} , a n -vec. of 0's and 1's $\ni A\vec{x} = \vec{1}$.

Subset Sum

Given: A multiset M and goal G , all ints.

Find: An $M' \subseteq M$ such that $G = \sum_{x \in M'} x$.

A Sample Reduction

$$A = \begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 1 & 1 & 0 \\ 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \end{pmatrix} \leq \begin{cases} M = \{ 10010_5, 00101_5, 00100_5, 01000_5 \} \\ G = 11111_5 \end{cases}$$

$$11111_5 = 1 * 5^4 + 1 * 5^3 + 1 * 5^2 + 1 * 5^1 + 1 * 5^0, \text{ etc.}$$

ZOE \leq ILP

Zero-One Equations (ZOE)

Given: A , an $m \times n$ matrix of 0's and 1's

Find: \vec{x} , a n -vec. of 0's and 1's $\ni A\vec{x} = \vec{1}$.

Int. Linear Programming (ILP)

Given: constraints $A\vec{x} \leq \vec{b}$

Find: A vector of integers $\vec{x} \ni A\vec{x} \leq \vec{b}$.

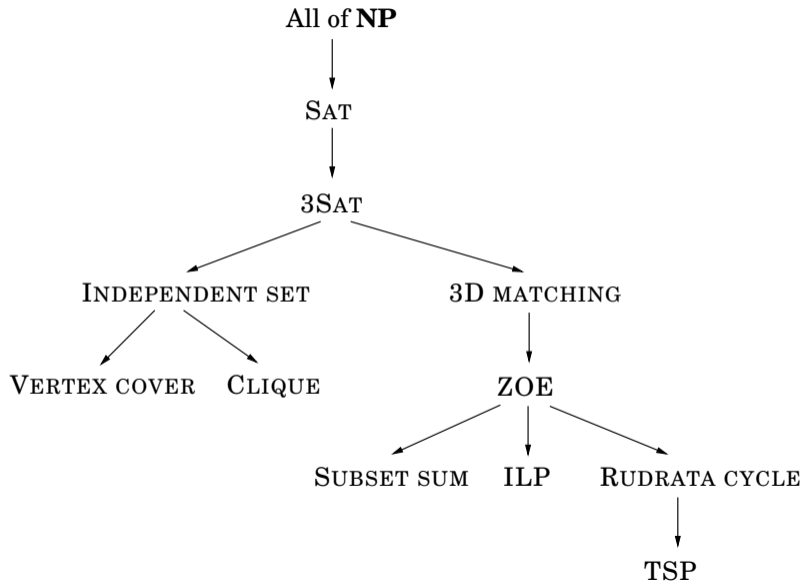
Reduction:

- Each ZOE equation: $\vec{a} \cdot \vec{x} = 1$
is rewritten to two inequalities: $\vec{a} \cdot \vec{x} \leq 1$ and $-\vec{a} \cdot \vec{x} \leq -1$
- Each ZOE variable x_i gets two additional constraints: $x_i \leq 1$ and $-x_i \leq 0$.

ZOE \leq Rudrata Cycle

See the text for this one.
It's proof is epic.

The Plan of §8.3



Rudrata/Hamiltonian Cycle \leq TSP

Rudrata/Hamiltonian Cycle Problem

Given: $G = (V, E)$, an undirected graph.

Find: A simple cycle that visits each vertex of G .

Traveling Salesman Problem (TSP)

Given: V' , n vertices; all $\frac{n \cdot (n-1)}{2}$ -many distances between them; and b , a budget

Find: π , an ordering of $1, \dots, n$, such that $\sum_{i=1}^n d_{\pi(i), \pi(1+(i \bmod n))} \leq b$

Construction Pick $\alpha \geq 1$.

Given (V, E) , define

$$V' = V$$

$$d_{i,j} = \begin{cases} 1, & \text{if } (i,j) \in E; \\ 1 + \alpha, & \text{otherwise.} \end{cases}$$

$$b = |V|$$

Claim: (V, E) has a R/H cycle $\iff (V', d)$ has tour of cost $\leq b$.

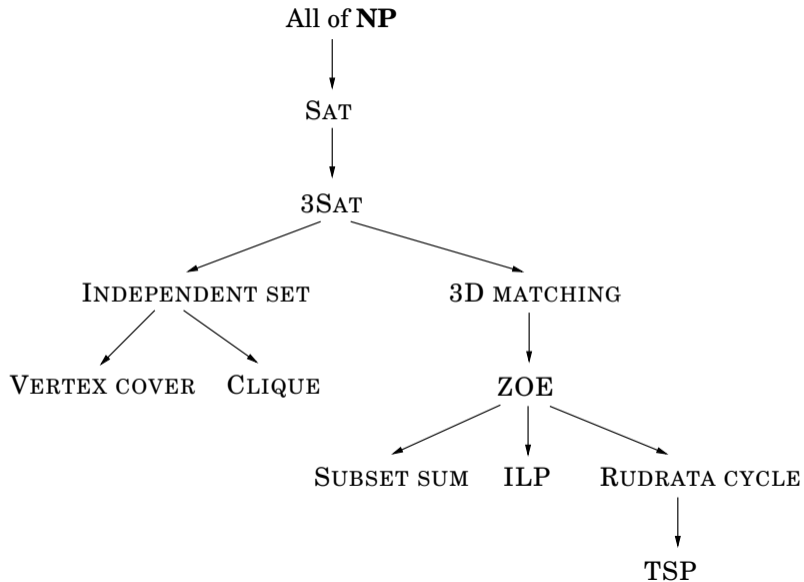
Note: If $\alpha = 1$:

- Distances satisfy the triangle inequality: $d_{ij} + d_{jk} \geq d_{ik}$.
- These instance of TSP are approximatable (Chap. 9).

Note: If $\alpha \gg 1$:

- Gap: either a solution of cost b ,
or solutions with costs $\geq b + \alpha$, but none in-between.

The Plan of §8.3



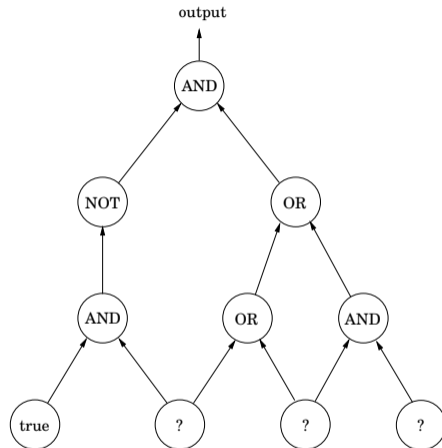
All of NP \leq Circuit SAT, 1

Circuit SAT

Given: A Boolean circuit, a dag with five types of gates

1. AND gates and OR gates (indegree 2)
2. NOT gates (indegree 1)
3. Known input gates (indegree 0) labeled True or False.
4. Unknown inputs gates (indegree 0) labeled "?".
5. An output gate (a particular sink)

Find: A truth assignment to the unknown input gates so that the circuit evaluates to True.



An instance of Circuit SAT

All of NP \leq Circuit SAT, 2

Circuit SAT

Given: A Boolean circuit, a dag with five types of gates

1. AND *gates* and OR *gates* (indegree 2)
2. NOT *gates* (indegree 1)
3. *Known input gates* (indegree 0) labeled True or False.
4. *Unknown inputs gates* (indegree 0) labeled "?".
5. An *output gate* (a particular sink)

Find: A truth assignment to the unknown input gates so that the circuit evaluates to True.

Proof sketch: Given an instance of SAT, just translate it to the corresponding instance of Circuit SAT.

Example, translate:

$$(\bar{x} \vee y \vee z) \wedge (x \vee \bar{y} \vee z) \wedge (x \vee y \vee z) \wedge (\bar{x} \vee \bar{y})$$

Claim 1

SAT \leq Circuit SAT

All of $NP \leq$ Circuit SAT, 3

Circuit SAT

Given: A Boolean circuit, a dag with five types of gates

1. AND gates and OR gates (indegree 2)
2. NOT gates (indegree 1)
3. Known input gates (indegree 0) labeled True or False.
4. Unknown inputs gates (indegree 0) labeled "?".
5. An output gate (a particular sink)

Find: A truth assignment to the unknown input gates so that the circuit evaluates to True.

Claim 2

Circuit SAT \leq SAT

Proof sketch: Given an instance of Circuit SAT, translate it to an instance of Circuit SAT as follows.

1. Assign each gate a unique variable.
2. For each gate g , build the following set of clauses

Case: $g = \text{?}$. Translates to: $\{ (g) \}$.

Case: $g = \text{true}$. Translates to: $\{ (g) \}$.

Case: $g = \text{false}$. Translates to: $\{ (\bar{g}) \}$.

Continued ...

Case: g = a NOT-gate with input h . Translates to: $\{ (g \vee h), (\bar{g} \vee \bar{h}) \}$.

Case: g = an OR-gate with inputs h_1 and h_2 . Translates to: $\{ (g \vee \bar{h}_1), (g \vee \bar{h}_2), (\bar{g} \vee h_1 \vee h_2) \}$.

Case: g = an AND-gate with inputs h_1 and h_2 . Translates to: $\{ (\bar{g} \vee h_1), (\bar{g} \vee h_2), (g \vee \bar{h}_1 \vee \bar{h}_2) \}$.

Moreover: If g is the output gate, we add the clause: (g) .

What is going on?

All of NP \leq Circuit SAT, 5

Circuit SAT

Given: A Boolean circuit, a dag with five types of gates

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5. An *output gate* (a particular sink)

Find: A truth assignment to the unknown input gates so that the circuit evaluates to True.

Recall from Chapter 7: Any polytime algorithm can be expressed as a boolean circuit (scaled to the input size). **Dirty trick warning!!!**

All of NP \leq Circuit SAT, 6

Circuit SAT

Given: A Boolean circuit, a dag with five types of gates

1. AND *gates* and OR *gates* (indegree 2)
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5. An *output gate* (a particular sink)

Find: A truth assignment to the unknown input gates so that the circuit evaluates to True.

Given an NP-problem Q with polytime checking function C .

- For instance I , build the boolean circuit B that checks I , with “?” labeling the “solution input gates.”
- Then I has a Q -solution $\iff B$ has a satisfying assignment.

•
• ...

All of $NP \leq$ Circuit SAT, 7

Theorem (The Cook-Levin Theorem)

SAT is NP-complete.

Next: Dealing with NP-completeness